INHOMOGENEOUS RANDOM GRAPHS AND THEIR SCALING LIMITS

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A model of inhomogeneous random graphs

- For $n \ge 1$, let $\mathbf{w} = (w_1, w_2, \cdots, w_n) \in (0, \infty)^n$: $w_i = \text{weight}$ of vertex *i*. For $r \ge 0$, denote $\sigma_r(\mathbf{w}) = \sum_{i=1}^n w_i^r$.
- ▶ Let \mathcal{G}_w be the graph with *n* vertices (labelled 1, 2, · · · , *n*) and where

 $(\mathbf{1}_{\text{edge }\{i,j\}\in\mathcal{G}_{\mathbf{w}}})_{1\leq i< j\leq n}$ are **independent** and have probabilities $f\left(\frac{W_{i}W_{j}}{\sigma_{1}(\mathbf{w})}\right)$,

where $f : \mathbb{R}_+ \to [0, 1]$ and $f(x) = x + \mathcal{O}(x^2)$, $x \to 0$.

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e.g. $f(x) = 1 - e^{-x}$: Poisson random graph Aldous '97, Norros & Reittu '05 $f(x) = x \wedge 1$: Chung & Lu '02 f(x) = x/(1+x): Britton & Deijfen & Martin-Löf '06

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Special case (homogenous case): (w_i) all **equal**, then $\mathcal{G}_w = G(n, p)$. In general, $\deg(i) \approx \text{Poisson}(w_i)$.

Scaling limits of \mathcal{G}_w

- $\mathcal{G}_{\mathbf{w}}^{k} \equiv k$ -th largest connected components of $\mathcal{G}_{\mathbf{w}}$.
- Each $\mathcal{G}_{\mathbf{w}}^k$ is a metric space equipped with $d_{gr} = graph$ distance of $\mathcal{G}_{\mathbf{w}}$.

Aim: Under suitable conditions on (\mathbf{w}_n) , find $\epsilon_n \to 0$ such that

$$\left(\mathcal{G}_{\mathbf{w}}^{k}, \ \epsilon_{n} \cdot d_{\mathrm{gr}}\right)_{k \geq 1} \xrightarrow[n \to \infty]{(d)} (\mathbf{G}_{k})_{k \geq 1}$$

in certain topology, where G_k , $k \ge 1$, are some compact (non trivial) metric spaces.

Scaling limits of \mathcal{G}_w

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[Janson '09] Asymptotic equivalence of random graphs: The choice of f is irrelevant. From now on, take $f(x) = 1 - e^{-x}$. \rightsquigarrow Encoding \mathcal{G}_w with stochastic processes

 \rightsquigarrow Convergence of the coding processes

 \rightsquigarrow Identifying the limit graphs.

Outline

► A LIFO queue representation of \mathcal{G}_w \rightsquigarrow Encoding \mathcal{G}_w with stochastic processes

► Embed G_w into Galton–Watson trees → Convergence of the coding processes

► Construction of the graphs from the limit coding processes ~> Identifying the limit graphs.

A LIFO queue representation of $\mathcal{G}_{\textbf{w}}$

A Last-In-First-Out queueing system:

- a single server
- n clients (labelled 1,..., n): Client i arrives at time E_i and requests service time w_i.
- clients in the queue are served in Last-In-First-Out order: whenever a new customer arrives, the server interrupts the current service (if any) and serves the new-comer. When the latter quits the queue, the server then resumes the previous service.

LIFO queue & coding functions

Define
$$Y_t^{\mathbf{w}} \equiv -t + \sum_{1 \le i \le n} w_i \mathbf{1}_{[0,t]}(E_i)$$
. Then
 $Y_t^{\mathbf{w}} - \inf_{s \le t} Y_s^{\mathbf{w}} = \text{ load of the server at } t.$



LIFO queue & coding functions

 $\mathcal{H}_t^{\mathbf{w}} \equiv \text{length of the queue at time } t$. By the LIFO rule, we have

$$\forall t \geq 0: \quad \mathcal{H}_t^{\mathbf{w}} = \# \Big\{ s \leq t: \inf_{u \in [s,t]} Y_u^{\mathbf{w}} > Y_{s-}^{\mathbf{w}} \Big\}.$$



LIFO queue & trees

LIFO queue \rightsquigarrow a sequence of family trees \mathcal{T}_w :

- Vertices of $\mathcal{T}_{w} = \{ \text{ labels of the } n \text{ clients } \}.$
- Children of i = labels of the clients interrupting the service of Client i.

We have

 $\mathcal{H}_t^{\mathbf{w}} = \text{height of } V_t$, where $V_t \equiv \text{label of the client served at time } t$.

In particular, each excursion of \mathcal{H}^w above 0 encodes a tree component in \mathcal{T}_w .



LIFO queue & graph \mathcal{G}_w

To sample some additional edges, let

$$\mathcal{P}^{\mathbf{w}} = \sum_{p \ge 1} \delta_{(t_p, y_p)}$$

be a Poisson point measure on \mathbb{R}^2_+ of intensity $\frac{1}{\sigma_1(\mathbf{w})} \mathbf{1}_{\{0 \le x \le Y_t^{\mathbf{w}} - \inf_{[0, t]} Y^{\mathbf{w}}\}} dt dx$. Set

 $\mathcal{A}^{\mathbf{w}} = \left\{ \{V_{s_p}, V_{t_p}\} : 1 \le p \le |\mathcal{P}^{\mathbf{w}}| \right\} \quad \text{where} \quad s_p \equiv \inf\{s : \inf_{s \le u \le t_p} Y_u^{\mathbf{w}} - \inf_{s \le t} Y_s^{\mathbf{w}} > y_p \}$



LIFO queue & graph \mathcal{G}_w

Denote by $\tilde{\mathcal{G}} = \mathcal{T}_{\mathbf{w}} \cup \mathcal{A}^{\mathbf{w}}$.

Theorem. Suppose $\frac{w_i}{\sigma_1(\mathbf{w})}E_i, 1 \leq i \leq n$, are i.i.d. $\mathbf{Exp}(1)$. Then $\tilde{\mathcal{G}} \stackrel{(\mathrm{d})}{=} \mathcal{G}_{\mathbf{w}}$.

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In consequence, \mathcal{G}_w is encoded by Y^w , \mathcal{H}^w and \mathcal{P}^w . Therefore, to find the scaling limit of \mathcal{G}_w , we look at

- ► the convergence of Y^w: √
- ▶ the convergence of \mathcal{P}^{w} : \checkmark
- ▶ the convergence of \mathcal{H}^{w} : not a continuous funct. of Y^{w} ...

Preview of the embedding

To embed \mathcal{G}_w into Galton–Watson trees,

- ▶ introduce a Markovian LIFO queue ~→ Galton–Watson trees
- embed the previous n-client queue into the Markovian one.

Markovian LIFO queue & GW trees

From now on, suppose $\sigma_2(\mathbf{w}) \leq \sigma_1(\mathbf{w})$.

A Markovian LIFO queueing system:

- A single server treats the clients in Last-In-First-Out order
- ► An ∞-sequence of clients arrive at rate 1:
 - the k-th client arrives at time τ_k ,
 - ▶ chooses his type $J_k \in \{1, ..., n\}$ with probabilities $\mathbf{P}(J_k = i) = \frac{w_i}{\sigma_1(w)}$
 - requests service time w_i if $J_k = i$.
- Load of the server: $X_t^{\mathbf{w}} \equiv -t + \sum_{k \ge 1} w_{J_k} \mathbf{1}_{[0,t]}(\tau_k)$. $X^{\mathbf{w}}$ is a Lévy process of Lévy measure $\nu_{\mathbf{w}} \equiv \frac{1}{\sigma_1(\mathbf{w})} \sum_i w_i \delta_{w_i}$ and ≤ 0 drift.
- As before, we can associate with the queue a sequence of family trees T_w . It turns out $T_w = i.i.d$. Galton–Watson trees with offspring distribution **Poisson**(W_n), where $W_n \sim \nu_w$.
- $\blacksquare \ H^w \equiv \text{length of the queue} = \text{height process of } T_w.$

Embedding of the *n*-client queue

Color the clients in blue or red according to the following rule:

- If the type of the k-th client ∈ {types of previous blue clients}, the client is in red;
- ▶ otherwise, the client inherits his color from his parent, with the convention that if there is no parent, the client is in blue.



Embedding of the *n*-client queue

 $\mathcal{B} \equiv \{t \geq 0 : \text{either a blue client is served at } t \text{ or the server is idle at } t\}$ Let

 $X^{\mathbf{w}} \circ \theta^{\mathbf{w}} =$ process obtained by **restricting** $X^{\mathbf{w}}$ to \mathcal{B} ,

namely, $\Lambda_t^{\mathsf{w}} \equiv \int_0^t \mathbf{1}_{\mathcal{B}}(s) ds$ and then $\theta_t^{\mathsf{w}} \equiv \inf\{s : \Lambda_s^{\mathsf{w}} > t\}$.

Lemma. We have

$$X^{\mathbf{w}} \circ \theta^{\mathbf{w}} \stackrel{(\mathrm{d})}{=} Y^{\mathbf{w}}, \quad \mathbf{H}^{\mathbf{w}} \circ \theta^{\mathbf{w}} \stackrel{(\mathrm{d})}{=} \mathcal{H}^{\mathbf{w}}.$$

Problem: difficult to prove directly the convergence of θ^{w} .



Another description of θ^{w}

Recall the *k*th client arrives at τ_k and is of type J_k . Let

$$X_t^{b,\mathbf{w}} \equiv X_{\theta_t^{\mathbf{w}}}^{\mathbf{w}} + \underbrace{\sum_{k \ge 1}^{A_t^{\mathbf{w}}} w_{J_k} \mathbf{1}_{\{\tau_k \in \partial \mathcal{B}\}} \mathbf{1}_{\{\Lambda_{\tau_k}^{b,\mathbf{w}} \le t\}}}_{k \ge 1} \quad \text{and} \quad \mathbf{X}^{r,\mathbf{w}} \equiv \mathbf{X}^{\mathbf{w}} - \mathbf{X}^{b,\mathbf{w}}$$

Lemma. $X^{b,w}, X^{r,w}$ are two independent copies of X^w . Moreover,

$$\theta_t^{\mathsf{w}} = t + \gamma_{A_t^{\mathsf{w}}}^{\mathsf{w}},$$

where $\gamma_{\!x}^{\mathbf{w}} = \inf\{t: X^{r,\mathbf{w}}_{\!s} < -x\}$ and

$$\mathcal{A}^{f w}_t = \sum_i w_i (N_i(t)-1)_+, \hspace{0.2cm} ext{where} \hspace{0.2cm} N_i(t) = \# \{ ext{jumps of } X^{b,f w} ext{ of type } i ext{ before } t \}$$



Construction of \mathcal{G}_w from Lévy processes

Sample X^{b,w}, X^{r,w}. Let X^{b,w}, X^{r,w} be two independent copies of a (sub-)critical spectrally positive Lévy process such that

$$\psi_n(\lambda) \equiv \log \mathbb{E}[e^{-\lambda X_1^b}] = \left(1 - \frac{\sigma_2(\mathbf{w})}{\sigma_1(\mathbf{w})}\right)\lambda + \int (e^{-\lambda u} - 1 + \lambda u)\nu_{\mathbf{w}}(du),$$

where $\nu_{\mathbf{w}} = \frac{1}{\sigma_1(\mathbf{w})} \sum_{i \ge 1} w_i \delta_{w_i}$. Set $X^{\mathbf{w}} \equiv X^{b,\mathbf{w}} + X^{r,\mathbf{w}}$.

Define Y^w. Let

$$Y^{\mathsf{w}} \equiv X^{b,\mathsf{w}} - A^{\mathsf{w}}, \quad \text{where} \quad A^{\mathsf{w}}_t \equiv \Sigma_i w_i (N_i(t) - 1)_+.$$

• Define θ^{w} . Set $\theta^{\mathsf{w}}_t = t + \gamma^{\mathsf{w}}_{A^{\mathsf{w}}_t}$, where $\gamma^{\mathsf{w}}_x = \inf\{t : X^{r,\mathsf{w}}_t < -x\}$.

▶ Define \mathcal{H}^{w} . Let

$$\mathcal{H}^{\mathsf{w}} = \mathsf{H}^{\mathsf{w}} \circ \theta^{\mathsf{w}} \quad \text{where} \quad \mathsf{H}^{\mathsf{w}}_{t} = \#\{s \leq t : X^{\mathsf{w}}_{s-} < \inf_{[s,t]} X^{\mathsf{w}}\}.$$

Sample additional edges according to $\mathcal{P}^{\mathbf{w}}$, which is a Poisson point measure on \mathbb{R}^2_+ of intensity $\frac{1}{\sigma_1(\mathbf{w})} \mathbf{1}_{\{0 \le x \le Y_t^{\mathbf{w}} - \inf_{[0,t]} Y^{\mathbf{w}}\}} dt dx$.

Construction of the limit graph: Part I

Sample X^b, X^r. Let X^b, X^r be two independent copies of a (sub-)critical spectrally positive Lévy process such that

$$\psi(\lambda) \equiv \log \mathbb{E}[e^{-\lambda X_1^b}] = \alpha \lambda + \frac{1}{2}\beta \lambda^2 + \int \kappa (e^{-\lambda u} - 1 + \lambda u)\pi(du)$$

where $\alpha, \beta \ge 0$, $\kappa > 0$ and $\pi = \sum_{j\ge 1} c_i \delta_{c_i}$ with $c_1 \ge c_2 \ge \cdots \ge 0$ satisfying $\sum_i c_i^3 < \infty$. Namely, $X_t^b = -\alpha t + \sqrt{\beta}B_t + \sum_{i>1} c_i (N_i(t) - c_i \kappa t),$

where B = standard Brownian Motion and $N_i =$ Poisson process of rate κc_i . \blacktriangleright Define Y. Let

$$Y \equiv X^b - A$$
, where $A_t \equiv \frac{1}{2} \beta \kappa t^2 + c_i (N_i(t) - 1)_+$.

• Define θ . Set $\theta_t = t + \gamma_{A_t}$, where $\gamma_x = \inf\{t : X_t^r < -x\}$.

Construction of the limit graph: Part II

Height process of a Lévy process. For the Lévy process X, we can define an analogue of the discrete height process H^w.

Le Gall & Le Jan '98: Suppose $\int^{\infty} d\lambda/\psi(\lambda) < \infty$. Then there exists a continuous process **H** such that

$$\mathbf{H}_t = \lim_{\epsilon \to 0} \frac{1}{\epsilon} \int_0^t \mathbf{1}_{\{X_s - \mathsf{inf}_{[s,t]} X < \epsilon\}} \quad \mathsf{exists in \ probability}$$

H is in fact the **height process** of the Lévy tree with branching mechanism ψ .

▶ Define *H*. Let

 $\mathcal{H} \equiv \mathbf{H} \circ \theta,$

Sample additional edges according to \mathcal{P} , which is a Poisson point measure on \mathbb{R}^2_+ of intensity $\mathbf{1}_{\{x \leq Y_t - \inf_{[0,t]} Y\}} dt dx$.

Theorem. Let
$$\mathbf{w}_n = (w_{n1}, \dots, w_{nn}), n \ge 1$$
. Denote $\psi_n(\lambda) = \log \mathbf{E}[e^{-\lambda X_1^{\mathbf{w}_n}}]$. Suppose $a_n \to \infty, \quad b_n/a_n \to \infty$ and $b_n/a_n^2 \to \beta_0 \in [0, \beta]$ satisfying that
(1) $\forall \lambda \ge 0: \quad b_n \psi_n(\lambda/a_n) \to \psi(\lambda)$ and $\lim_{y \to \infty} \limsup_{n \to \infty} \frac{a_n}{b_n} \int_{y/a_n}^1 \frac{d\lambda}{\psi_n(\lambda)} = 0.$

Then we have

(2)
$$\left(\left(\frac{1}{a_n}Y_{b_nt}^{\mathbf{w}_n}\right)_{t\geq 0}, \left(\frac{a_n}{b_n}\mathcal{H}_{b_nt}^{\mathbf{w}_n}\right)_{t\geq 0}, \tilde{\mathcal{P}}^{\mathbf{w}_n}\right) \xrightarrow{d} (Y, \mathcal{H}, \mathcal{P}) \text{ in } \mathbb{D} \times \mathbb{C} \times \mathcal{M}(\mathbb{R}^2_+),$$

where $\langle f, \tilde{\mathcal{P}}^{\mathbf{w}_n} \rangle = \sum_{p \ge 1} f(\frac{t_p}{b_n}, \frac{y_p}{a_n}), \, \forall \, f : \mathbb{R}^2_+ \to \mathbb{R}_+$ measurable.

Essential ingredient of the proof:

Duquesne & Le Gall '02 Under Condition (1), we have the convergence of the Poisson(W_n)-Galton–Watson trees to ψ -Lévy trees.

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We can deduce from (2) the convergence of the graph $\mathcal{G}_{\mathbf{w}_n}$:

$$(\mathcal{G}_{\mathbf{w}_n}^k, \tfrac{a_n}{b_n} d_{\mathrm{gr}})_{k \geq 1} \xrightarrow{d} (\mathbf{G}_k)_{k \geq 1} \quad \text{ in Gromov-Hausdorff topology},$$

where G_k , $k \ge 1$, are the connected components of the limit graph constructed from $(Y, \mathcal{H}, \mathcal{P})$.

From the previous theorem, we can recover

- Addario-Berry & Broutin & Goldschmidt '12 G(n, p): (w_{ni}) all equal, then $\psi(\lambda) = \alpha \lambda + \lambda^2/2$.
- ▶ Bhamidi & van der Hofstad & Sen '17+ Power-law case: $w_{ni} \sim (n/i)^{\gamma}, \gamma \in (\frac{1}{3}, \frac{1}{2})$, then $\beta = 0$ and $c_i = i^{-\gamma}, i \ge 1$. Moreover, they show dim_h(\mathbf{G}_k) $\le \frac{1-\gamma}{1-2\gamma}$, a.s.

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[Duquesne & Le Gall '05] fractal properties of Lévy trees + our construction of G_k Proposition. Let

$$\overline{\gamma} := \inf\{s \ge 0: \lim_{j \to \infty} j^s c_j = \infty\} \quad \text{ and } \quad \underline{\gamma} \equiv \sup\{s \ge 0: \lim_{j \to \infty} j^s c_j = 0\}$$

Suppose $\beta = 0$ and $\overline{\gamma} < 1/2$. Then **P**-a.s. for all $k \ge 1$,

$$\dim_p(\mathbf{G}_k) = rac{1-\gamma}{1-2\gamma}$$
 and $\dim_h(\mathbf{G}_k) = rac{1-\overline{\gamma}}{1-2\overline{\gamma}}.$

In particular, if (c_j) varies regularly with index γ , then $\dim_p(\mathbf{G}_k) = \dim_h(\mathbf{G}_k) = \frac{1-\gamma}{1-2\gamma}$.

Simulation of large $\mathcal{G}_{\mathbf{w}}^{k}$

Homogeneous case



Power law case

THANK YOU!